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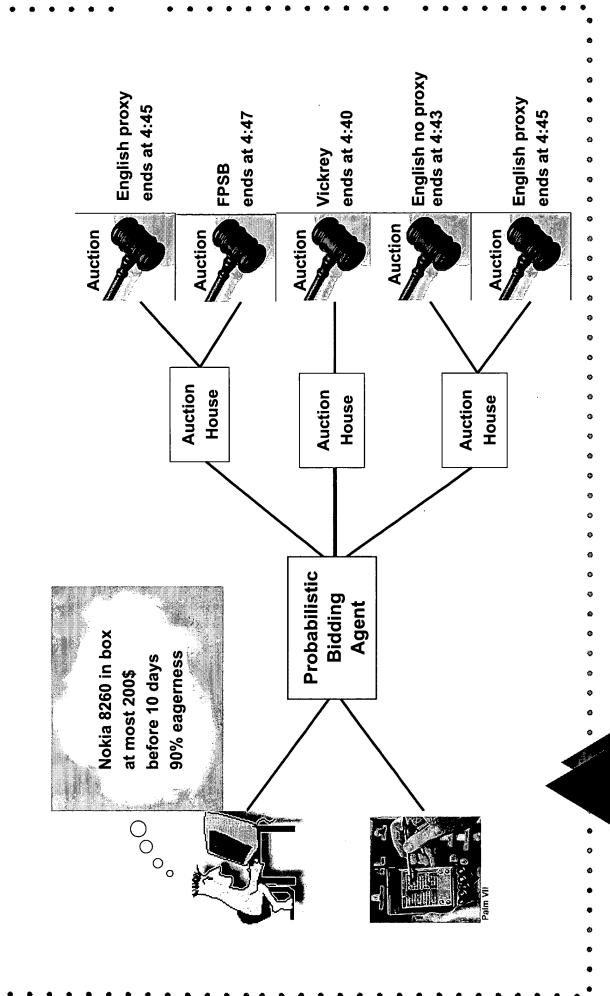
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### Probabilistic Automated Bidding in Alternative Auctions

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#### Goal

To obtain one unit of an item at the lowest price, given the following parameters:

M: The maximum bidding price

D: The deadline for obtaining the item

G: The eagerness to obtain the item





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Auctions are single-unit with fixed deadlines:

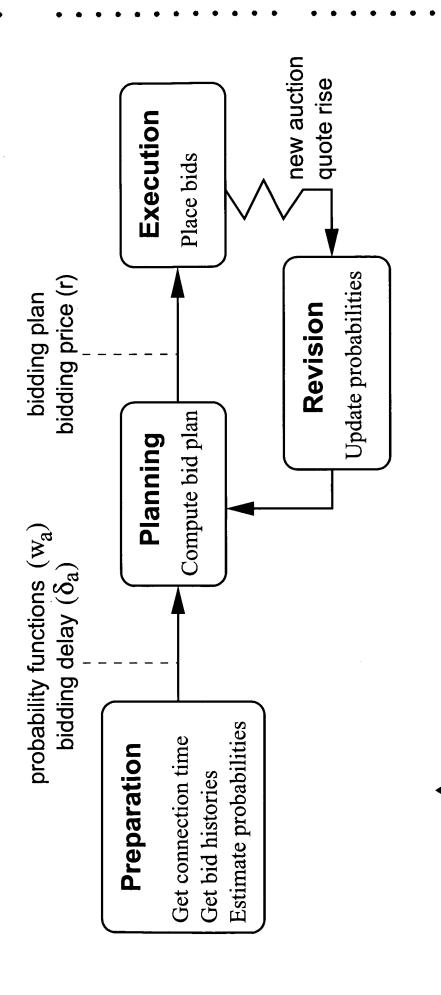
eBay-style auctions with or without proxy bids

FPSB and Vickrey auctions



#### Approach

# A bidding agent operates in 4 phases:





# Preparation: Probability estimation

Given the history of Winning Bids (W.B.) and the quote q of an auction, the probability of winning with a bid of r can be computed in two ways. Histogram method

$$v(r) = \frac{\text{\# of auctions with W.B. between q and r}}{\text{\# of auctions with W.B. greater than q}}$$



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Histogram method

$$w(r) = \frac{\text{\# of auctions with W.B. between q and r}}{\text{\# of auctions with W.B. greater than q}}$$

Normal distribution method

$$\sqrt{(\mathbf{r})} = \frac{\int_{\frac{z-\mu}{\sigma}}^{\frac{z-\mu}{\sigma}} e^{-x^2/2} dx}{\int_{\frac{q-\mu}{\sigma}}^{\frac{q-\mu}{\sigma}} e^{-x^2/2} dx}$$

$$\mu$$
 = average W.B.  $\sigma$  = std. dev. of W.B.

## Planning: Problem statement

Given a set A<sub>a</sub> of announced auctions, find:

A set of auctions  $A_s \subseteq A_a$ 

A bidding price r < M





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such that:

Auctions in A<sub>s</sub> are mutually compatible

$$\forall a_1, a_2 \in A_s |end(a_2) - end(a_1)| \geq \delta_{a1} + \delta_{a2}$$

Probability of winning 1 auction is satisfactory

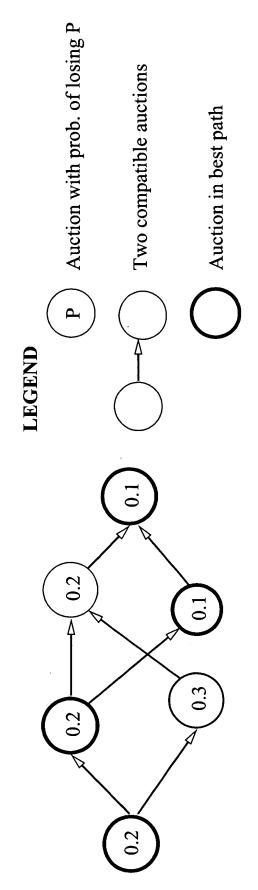
$$1 - \prod_{a \in A_s} (1 - w_a(r)) \ge G$$

r is minimal w.r.t. the previous constraints



# Planning: Computing the best plan

best bidding plan using a *critical path algorithm*. For a given price r, it is possible to compute the



Prob. of winning in best plan = 1 - .004 = 99.6%Prob. of loosing in best plan =  $.2^2 \times .1^2 = .004$ 



# Planning: Minimising the bidding price

For each r between 1 and M

If the prob. of winning with this plan is  $\geq$  G, Compute the best bidding plan at price r; stop iterating

If no appropriate r is found, notify the user. Otherwise, take r as the bidding price. Note: Binary search can be used as optimisation





### Plan execution

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The agent places bids of amount r, using proxy bidding and sniping tools if applicable. The agent requests quotes of ongoing auctions and retrieves new auctions. A plan revision is triggered in the following cases:

A new auction for the required item appears

The quote of an auction in the plan rises above the bidding price





# Heterogeneity between auctions

Alternative auctions are often heterogeneous:

- Different item characteristics
- Different settlement and shipping conditions

Different sellers



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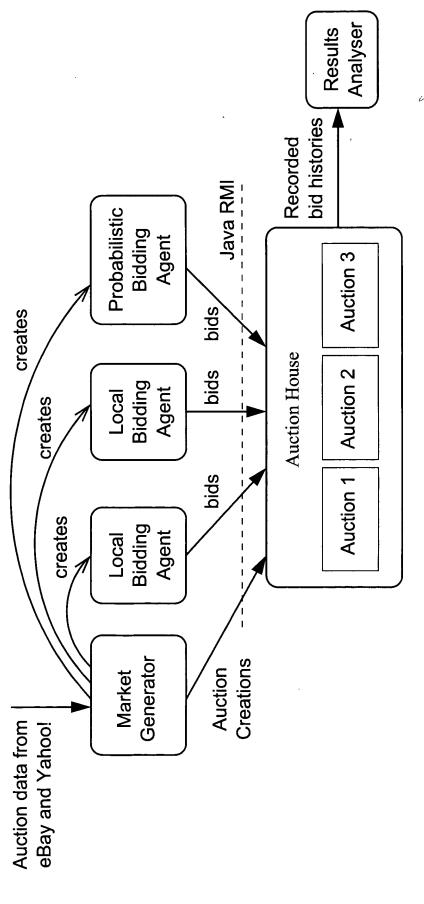
Different sellers

Two approaches to deal with heterogeneity:

 Price differentiation. The user sets a different maximum price for each auction

Utility differentiation. The user provides a multi-attribute scoring system

## Auction simulation platform







### **Tested claims**

1. The percentage of times that a probabilistic bidder wins is equal to its eagerness





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- 2. Probabilistic bidders pay less than local ones

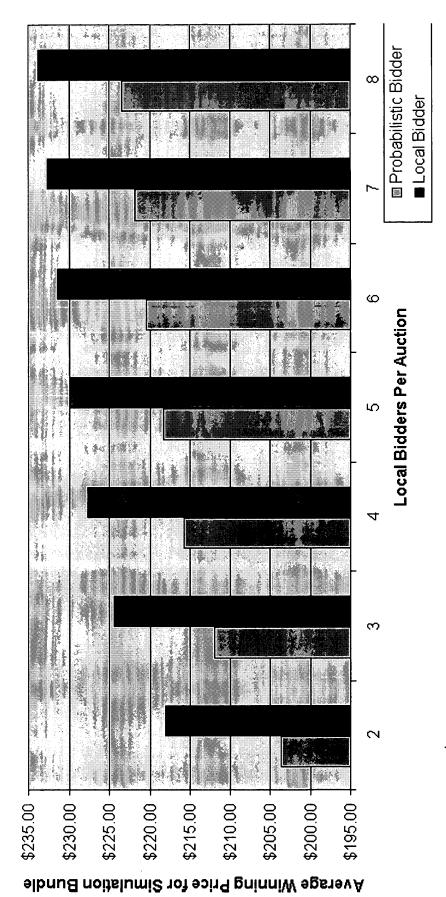


### **Tested claims**

- . The percentage of times that a probabilistic bidder wins is equal to its eagerness
- 2. Probabilistic bidders pay less than local ones
- 3. The welfare of the market increases with the number of probabilistic bidders



## Validation of Claim 2

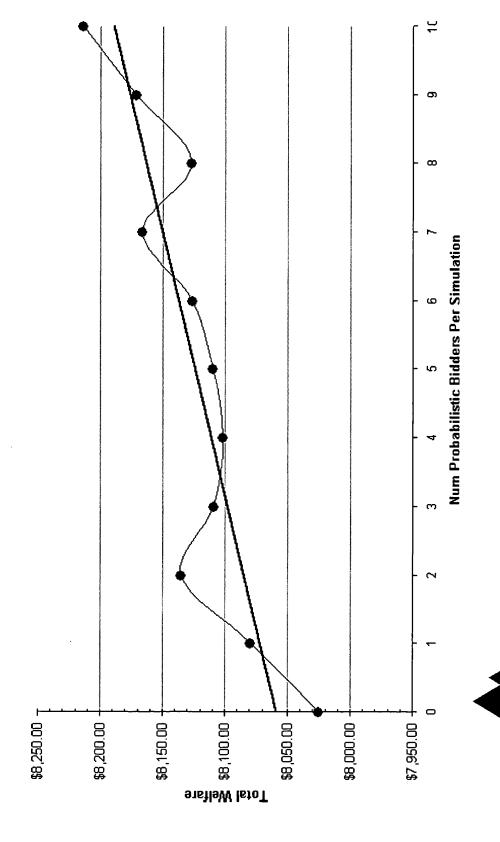




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### Experimentation

## Validation of Claim 3







#### Conclusion

Probabilistic bidding agents:

allow bidders to make tradeoffs between price and eagerness;

increase the payoff of their users and the welfare of the market

Future extensions:

Multiple units of an item / multi-unit auctions Interrelated items (all-or-none transactions)

